



# Excellence in Computational Biology and Informatics

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A LIFE OF SCIENCE



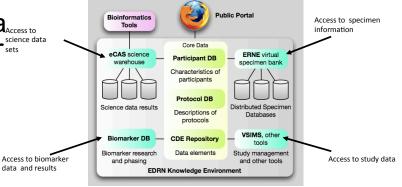


### **EDRN Informatics**



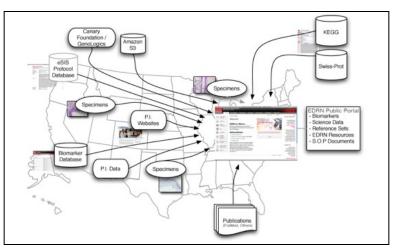
 NCI/JPL partnered since 2001 to develop a<sub>Access to</sub> long term distributed knowledge system for sets the EDRN

- Significantly leveraged the NASA model
  - Implemented Apache OODT from JPL
  - Architecture and approach
  - Open Source, Data Intensive Science approach
  - 2011 NASA Award for the accomplishment
- Supports capture and access to a diverse collection of distributed sets of information and results
  - Biomarkers
  - Biospecimens
  - Scientific Data Sets
  - Protocols
  - Etc



http://cancer.gov/edrn (operational) http://edrn.jpl.nasa.gov (beta; emerging capabilities)

### Integrated knowledge environment





# Supporting the Science Data Lifecycle



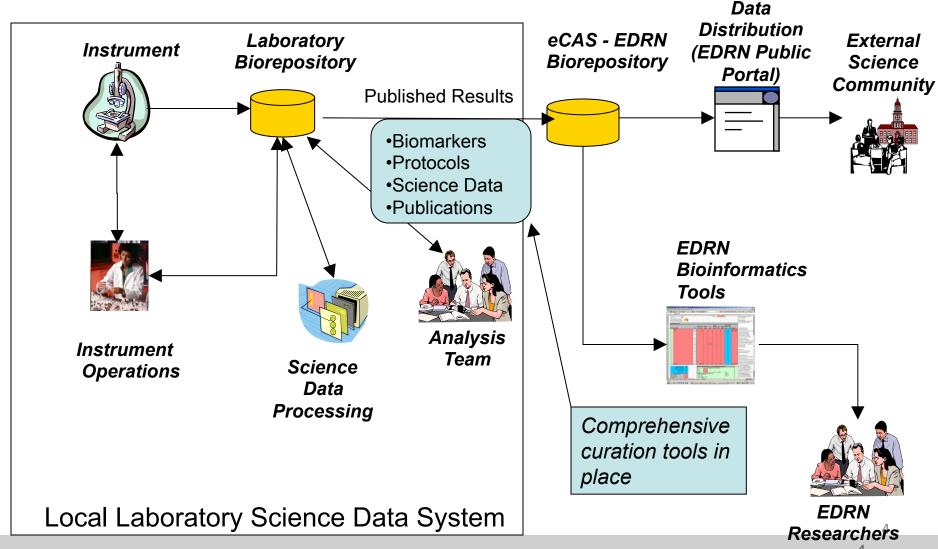
- Ingestion of data: Steps for transformation and validation including curation and peer review of the data
- <u>Cataloging of Structured and Unstructured Data</u>: Separation of the description (catalog) of data from the physical data storage
- <u>Data Processing</u>: Highly validated, scalable pipelines and jobs for remote sensing instruments; versioning of algorithms and data; this can be done by distributed teams prior to submitting to national archives
- <u>Data Management</u>: Construction and management of metadata catalogs and data (often distributed); capture of raw and processed data.
- <u>Data Discovery</u>: Discovery of data for scientific research
- Data Access: Access to the scientific data
- <u>Data Distribution, Computation and Analysis</u>: Support for analysis and services (e.g., subsetting) on the data; move towards automated data discovery



### Capture of Public Science Data

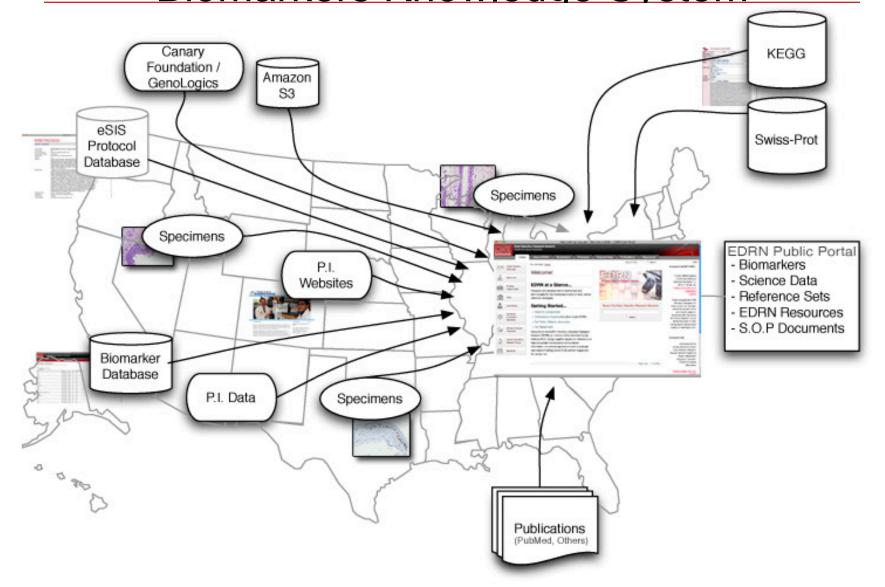


### An Integrated Repository of Public Data Sets





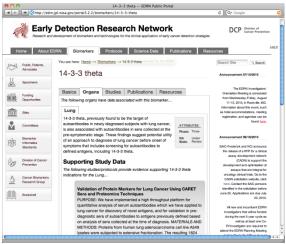
## A Virtual, National Integration Biomarkers Knowledge System Jet Propulsion Laboratory California Institute of Technology





## Biomarker Knowledge System: An integrated semantic architecture





#### **Biomarker Annotations**



**Specimens** 



**Early Detection Research Network** 

Welcome to EDRN

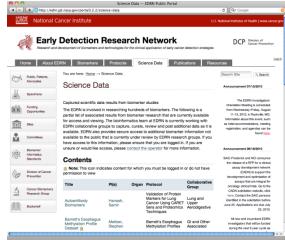
Getting Started...

Funding Opportunities

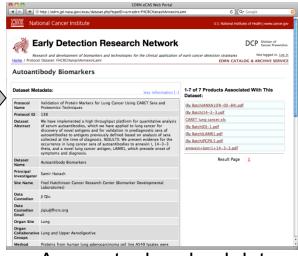
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Linked through Public Portal

DCP Division of Carons Properties



### Biomarker Data Results



Access to download data

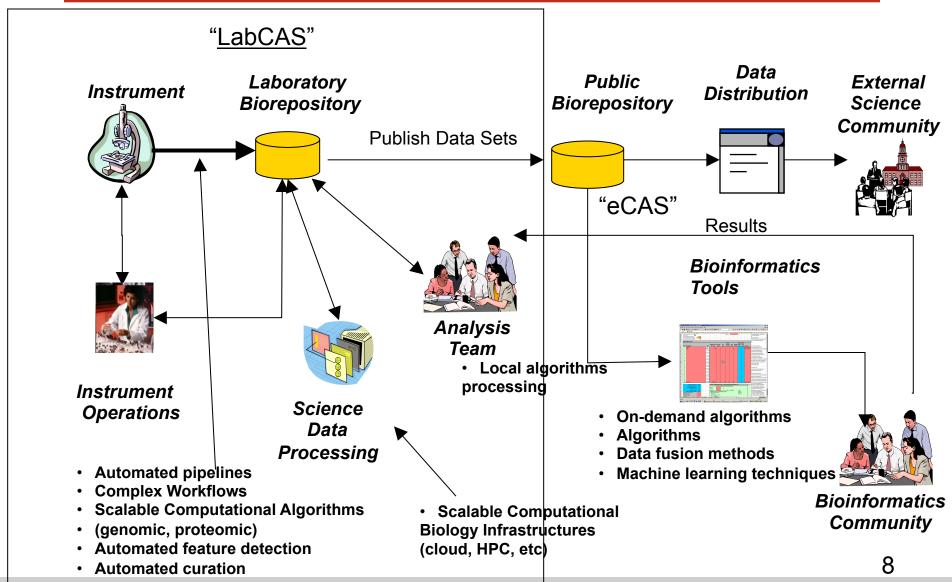


# Cancer Biomarker Bioinformatics Workshop

- The EDRN and NASA Jet Propulsion Laboratory held a workshop in May 2013 at Caltech to address informatics and data-driven research in cancer biomarkers
  - http://edrn.nci.nih.gov/cancer-bioinformatics-workshop/cancer-biomarker-bioinformatics-workshop-report-may-2013
  - A major outcome focused on data usability, reproducibility of results, methods and algorithms to systematize data analysis, and scalable computing infrastructures.
- Key Recommendations
  - Systematic approaches to the generation, capture, management of data to enable <u>reproducibility</u>.
  - Increased emphasis on <u>data curation</u> to promote data reuse
  - Automation of data process/analytics software pipelines
  - Data integration and fusion of data from multiple platforms, studies
  - Scalable data infrastructures and repositories
  - Use of big data tools and bioinformatics techniques to scale data analysis
  - Increased <u>training</u> of scientists in the use of computational tools/methods

Early Detection Research Network

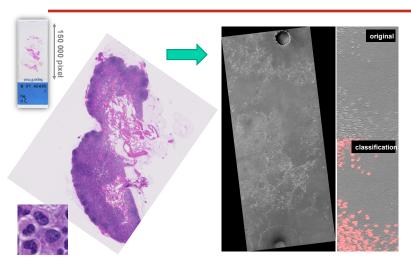
## Moving towards data-driven science for Jet Propulsion Laboratory California Institute of Technology

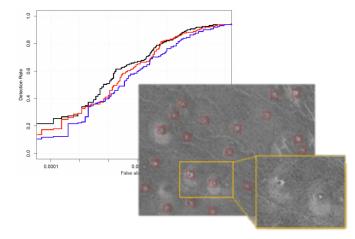




## Application of Machine Learning Techniques







Volcanoes on Venus

#### **TMA Estimator**



Estimate the Staining on a whole spot

#### **TMA Annotator**



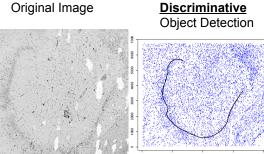
Detect nuclei on a whole spot

#### TMA Classifier



Classify single nuclei into tumor, non-tumor and stained, not-stained

#### ainal Imaga



Generative
P. Process Fitting

**Automated Classification** 

Feature/Object Detection



### Today



- Good opportunities to look at collaborations around datadriven computational science approaches
  - Excellent speakers
- Recommend those that are interested to check out the Caltech/JPL Virtual Summer School on Big Data Analytics through Coursera or on the Caltech website
  - Started Sep 2, 2014
  - 1500 people signed up to watch
- I hope you enjoy the session!



### Backup



11/13/14

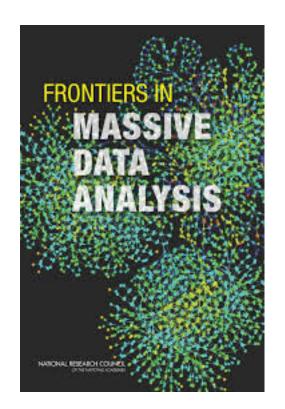
#### Early Detection Research Network

### National Research Council:

### Frontiers in Massive Data Analsyis



- Chartered in 2010 by the National Research Council
- Chaired by Michael Jordan, Berkeley, AMP Lab (Algorithms, Machines, People)
- Importance of systematizing the analysis of data
- Need for end-to-end approaches to data analysis
- Integration of multiple disciplines
- Application of novel statistical and machine learning approaches for data discovery
- The movement from computationintensive to data-intensive



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